

# Genome-Wide association study for resistance to aerial propagation of leaf scald in sugarcane (*Saccharum* spp)

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## Sugarcane modern cultivars (*Saccharum* spp.)

- **Two autopolyploid ancestral species :**
  - ✓ *S. spontaneum*, wild type (2n=6x to 16x=40 to 128)
  - ✓ *S. officinarum*, domesticated type (2n=8x=80)
- **Limited number of founder parents and recombination events**
- **Highly polyploid (2n= 110 to 130) and aneuploid.**
  - 70 to 80% of chromosomes derived from *S. officinarum*, 10 to 20% of *S. spontaneum* and 10% derived from interspecific recombination
- **Strong Linkage Disequilibrium which sharply decreases after 5 cM** (Raboin et al., 2008, TAG, 116:701-714)
- **Association mapping feasible with a reasonable number of markers.**



## Leaf Scald (LS) of sugarcane

- **Causal agent: *Xanthomonas albilineans***  
Xylem invading bacteria
- **Present in more than 60 locations in the world**
- **One of the most important diseases of sugarcane, several outbreaks of the disease in the Caribbean in the late 1980s**
- **Controlled by healthy material planting and genetic resistance.**
- ***Xanthomonas albilineans* spread**  
Mechanical / aerial contamination  
Epiphytic life of the leaf scald pathogen = important feature in the disease cycle, at least in humid tropical areas

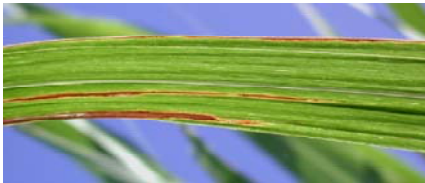
**Objective :** As resistance is the most efficient control method, we undertook a genome-wide association study to tag alleles controlling LS resistance.

## Materials and methods

### Plant material and field trials

- **189 interspecific sugarcane cultivars (*Saccharum* spp.)** representing the worldwide diversity were **assessed for LS resistance**
- **Two field trials (T1 and T2)** organized in complete randomized bloc design with **3 replications**.
- **Two successive crop cycles (R1 and R2)** analyzed for each trial, resulting in **4 datasets (T1R1, T1R2, T2R1 and T2R2)**
- **Disease Severity (DS)** was calculated by measuring once **leaf symptoms (LS)** on **10 stalks (S)** per replication (scale 0-5 related to the amount and length of foliar necrotic lesions) (Champoiseau et al., 2009, Plant dis. 93:339-346).

$$DS = \frac{\sum(LS)}{5 \times S}$$



### Statistical analysis

- ArcSin√(DS) were analyzed with SAS procedure Mixed (SAS V9.2) using the following model:

$$P_{ij} = \mu + G_i + B_j + e_{ij}$$

with  $\mu = \text{mean}(\text{ArcSin}\sqrt{(\text{DS})})$ ,  $G_i$  random genotypic effect,  $B_j$  fixed bloc effect,  $e_{ij}$  residual.

- BLUP (Best Linear Unbiased Predictors), were then estimated for each cultivar, with

$$BLUP = \mu + \text{Solution of random genotypic effect,}$$

- Final phenotypic value was calculated for each cultivar in each dataset with the following reverse function of ArcSin √ DS:

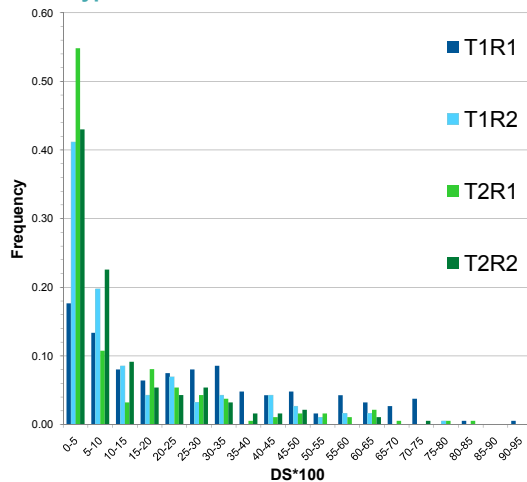
$$DS' = (\sin(BLUP))^2$$

### Genetic analysis

- **Population structure was analyzed by principal component analysis (SAS V9.2)** using not tightly linked markers and a Tracy-Widom test (Patterson et al., 2006, PlosGenet. 2(12):e190)
- **Association detection between 4189 polymorphic markers (AFLP + DArT) and DS' values** was performed using General Linear Model on Tassel software, with **population structure related to significant axes as covariate** (Zhu and Yu, 2009, Genetics 182:875-888).
- **Marker-trait associations** were considered significant at a **type-I genome-wide (GW) error threshold of 0.05** on the basis of **1000 permutations tests** (Doerge and Churchill, 1996, Genetics 142:285-294). **Cross-validations** were made between trials with a **marker-wise (MW) type-I error threshold of 0.05 (1000 permutations)**.

## Results

### Phenotypic variation



**Figure 1:** Distribution of sugarcane cultivars in DS class in the 4 datasets (T1R1, T1R2, T2R1 and T2R2) under natural disease pressure.

### Genome-wide marker-trait association

- 72 markers associated with DS variation
  - 33 sensibility markers
  - 39 resistance markers
- 17 markers among the 72 have been detected in more than 1 dataset.
- Within the 37 markers detected at least once at  $P \leq 0.001$ , 15 markers were confirmed in another dataset at  $P \leq 0.01$  or  $P \leq 0.05$

### Marker-wise cross-validation

71 markers among 72 were cross-validated in another dataset at a nominal  $P \leq 0.05$ . All of them keep their effect orientation (sensibility / resistance).

**Table 1:** Number of marker detected in each datasets at a GW  $P \leq 0.001$ ,  $P \leq 0.01$  and  $P \leq 0.05$

	Marker	T1R1	T1R2	T2R1	T2R2
$P \leq 0.001$	37	6	10	17	10
$P \leq 0.01$	41	2	1	2	1
$P \leq 0.05$	72	9	11	12	13
		17	22	31	24

**Table 2:** Number of markers detected in common between datasets at a GW  $P \leq 0.001$ ,  $P \leq 0.01$  and  $P \leq 0.05$ .

	3 times	2 times	1 time
$P \leq 0.001$	0	6	31
$P \leq 0.01$	1	6	34
$P \leq 0.05$	5	12	55

**Table 3:** Number of markers detected one or 2 times at a GW  $P \leq 0.001$ ,  $P \leq 0.01$  and  $P \leq 0.05$  in one trial and validated at a MW  $P \leq 0.05$  in the other trial

	T1			T2		
	R1 and R2	R1 or R2	T2 validation	R1 and R2	R1 or R2	T1 validation
$P \leq 0.001$	1	14	14	0	27	23
$P \leq 0.01$	2	15	17	0	30	26
$P \leq 0.05$	4	31	31	3	49	47

## Conclusions

- Overlapping of marker-trait associations sets between datasets, despite variability of annual environmental effects on cultivar LS resistance values
- Perfect consistency of the direction of marker effects (resistance or susceptibility) across the 4 datasets
- **Toward testing the efficiency of marker-assisted breeding for sugarcane LS resistance...**